

# ASTROSTAT-II

Development of Novel Statistical Tools  
for the Analysis of Astronomical Data

Andreas Zezas  
CfA / Univ. of Crete

# **What is ASTROSTAT-II ?**

# What is ASTROSTAT-II ?

The follow-up of ASTROSTAT-I !

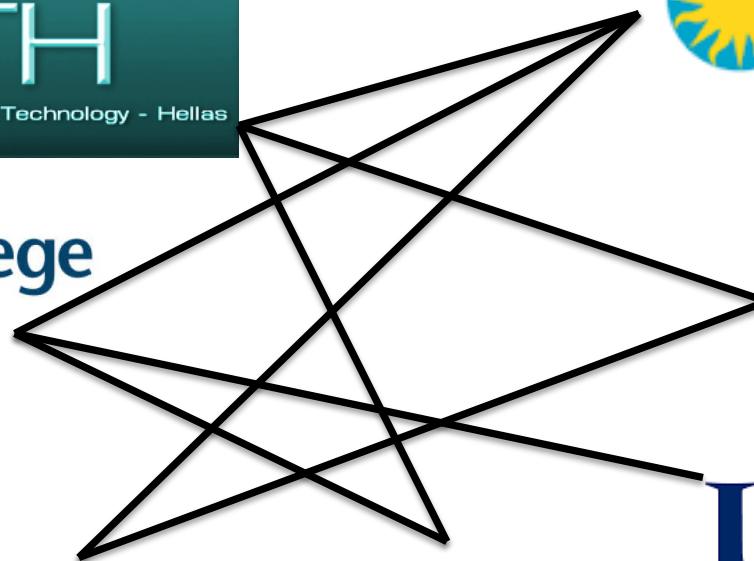
# ASTROSTAT-I Network



Imperial College  
London



UNIVERSITÉ  
DE GENÈVE



NORTHWESTERN  
UNIVERSITY  
1851  
Northwestern  
University

**UCDAVIS**  
UNIVERSITY OF CALIFORNIA

# ASTROSTAT-I

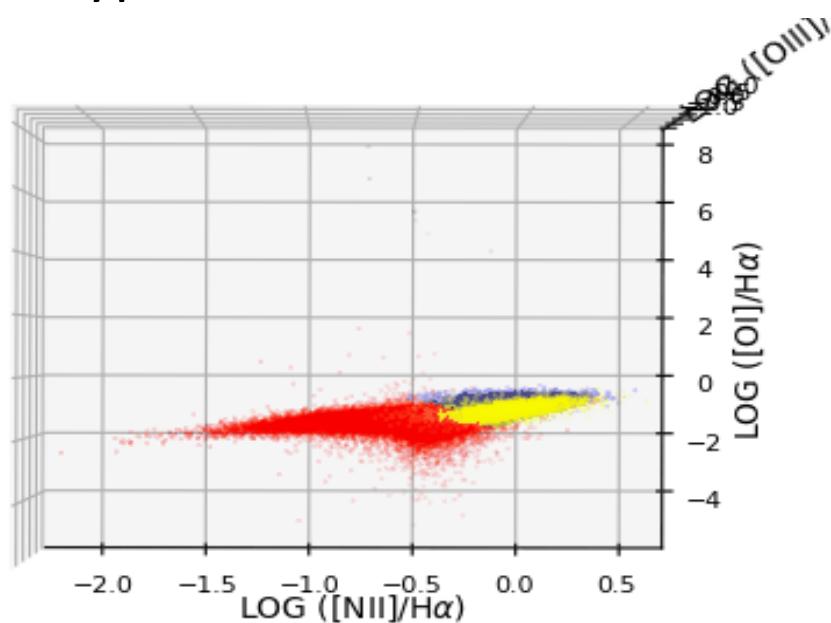
- Image Analysis
- Classification
- Fitting complex data

# Highlights of ASTROSTAT-I

- Source classification
  - Classification of galaxies (**Stampoulis**)
  - Classification of X-ray binaries (**Maragkakis**)
  - Supernova remnant classification (**Kopsacheili**)
  - Stellar spectral type classification

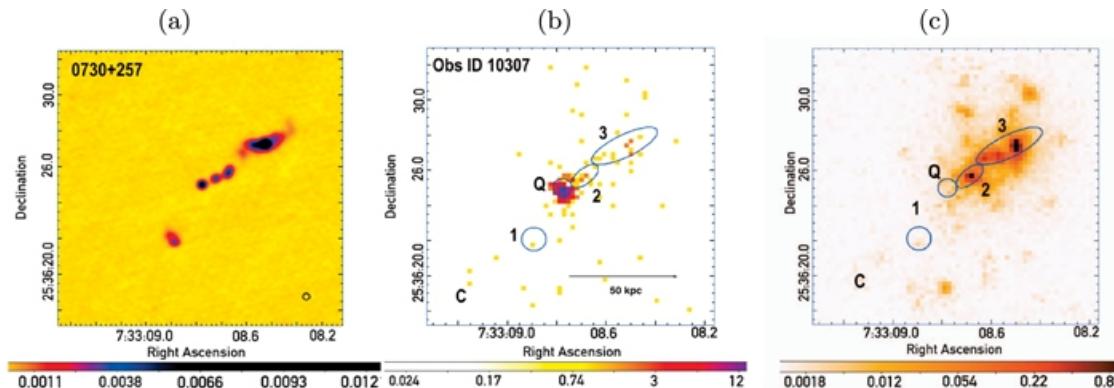
# Highlights of ASTROSTAT-I

- Source classification
  - Classification of galaxies (**Stampoulis**)
  - Classification of X-ray binaries (**Maragkakis**)
  - Supernova remnant classification (**Kopsacheili**)
  - Stellar spectral type classification

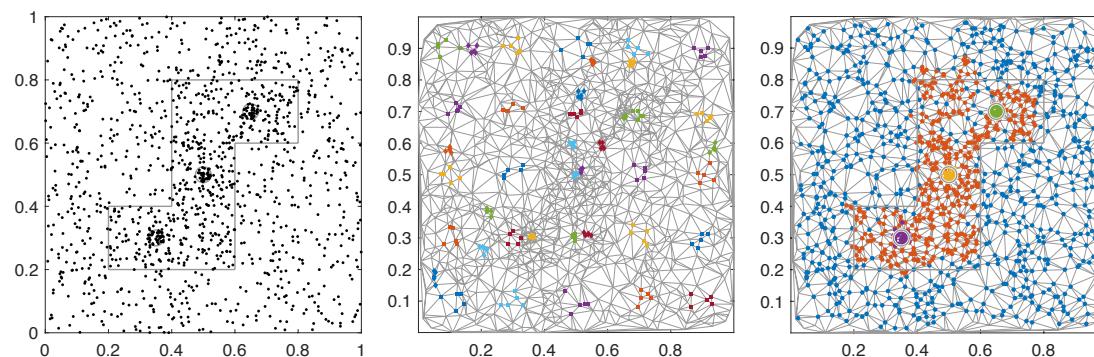


# Highlights of ASTROSTAT-I

- Imaging analysis
  - LIRA (**McKeough / Stein**)
  - Seeded Region Growing in Poisson regime (**Fan / Lee**)



McKeough et al. 2016



Fan et al. In prep

# Highlights of ASTROSTAT-I

- Source classification
  - Classification of galaxies (**Stampoulis**)
  - Classification of X-ray binaries (**Maragkakis**)
  - Stellar spectral type classification
- Imaging analysis
  - LIRA (**McKeough / Stein**)
  - Seeded Region Growing in Poisson regime (**Fan / Lee**)
- Fitting / inference
  - Interpolation of sparse multi-dimensional data (**Fragos / Zevin**)
  - SN cosmology (van Dyk / Mandel)

# What is ASTROSTAT-II ?

Continuation and extension of  
ASTROSTAT-I

# ASTROSTAT-II Network

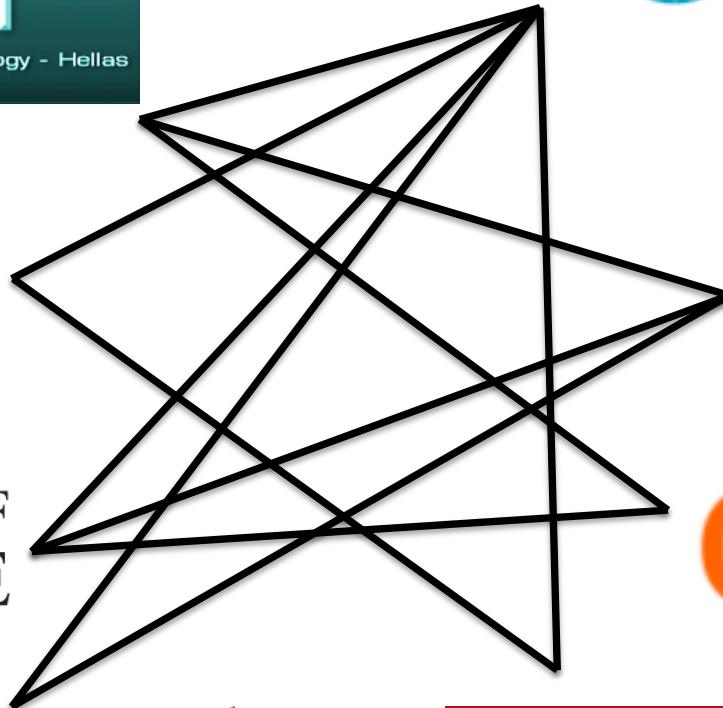


Imperial College  
London

UNIVERSITY OF  
CAMBRIDGE



UNIVERSITÉ  
DE GENÈVE



SAO



Northwestern  
University

Caltech

SFU

# ASTROSTAT-II

- Source classification
- Imaging analysis
- Fitting / inference
- Timing

# ASTROSTAT-II

- Source classification
  - Classification of X-ray binaries
  - Solar Region Classification
- Imaging analysis
  - Fine structure in galaxies
  - LIRA
  - Confused sources
- Fitting / inference
  - X-ray binary popualtion synthesis
  - Model uncertainties (DEM / CMD)
  - SN cosmology
- Timing
  - Variability in n-D
  - Detection + characterization of transients

# ASTROSTAT-II

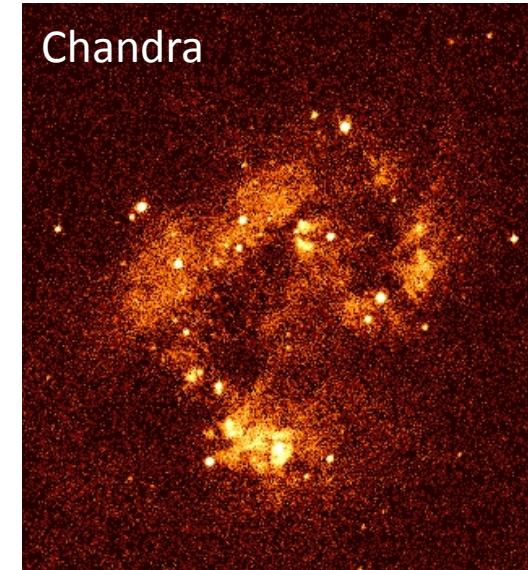
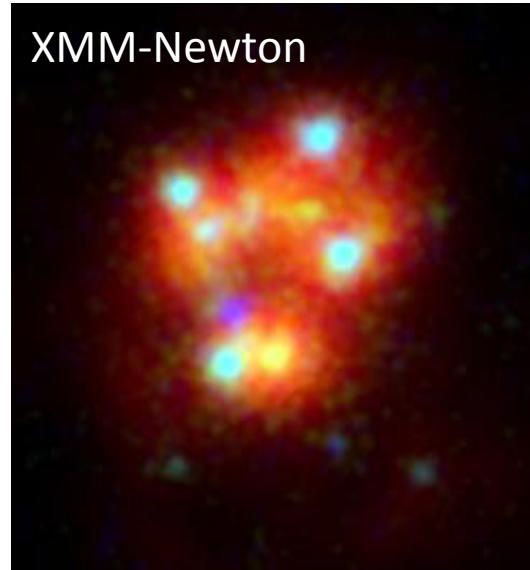
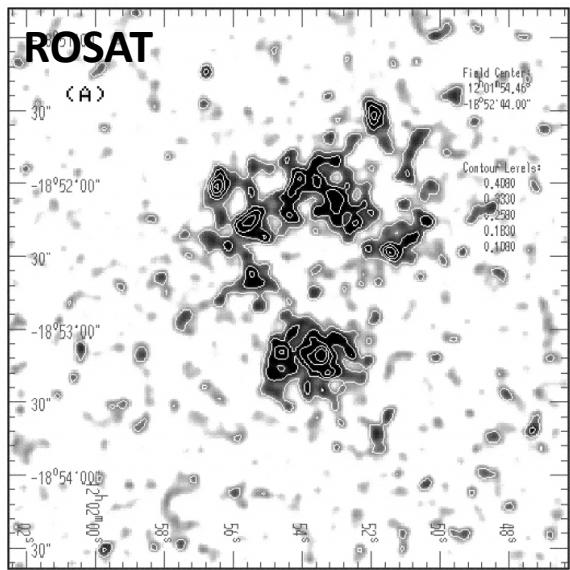
- Source classification
  - Classification of X-ray binaries
  - Solar Region Classification
- Imaging analysis
  - Fine structure in galaxies
  - LIRA
  - Confused sources
- Fitting / inference
  - X-ray binary popualtion synthesis
  - Model uncertainties (DEM / CMD)
  - SN cosmology
- Timing
  - Variability in n-D
  - Detection + characterization of transients

# Imaging analysis

Wide range of quality (resolution, depth)

Observations = Real image \* instrument response  
(Point Spread Function)

# Imaging analysis



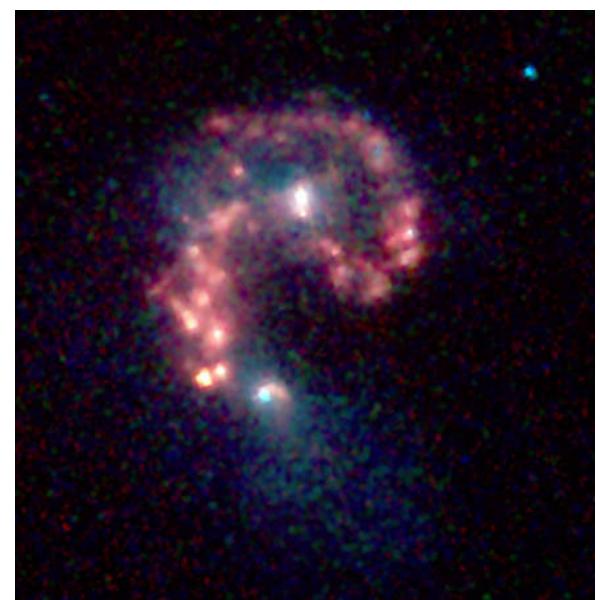
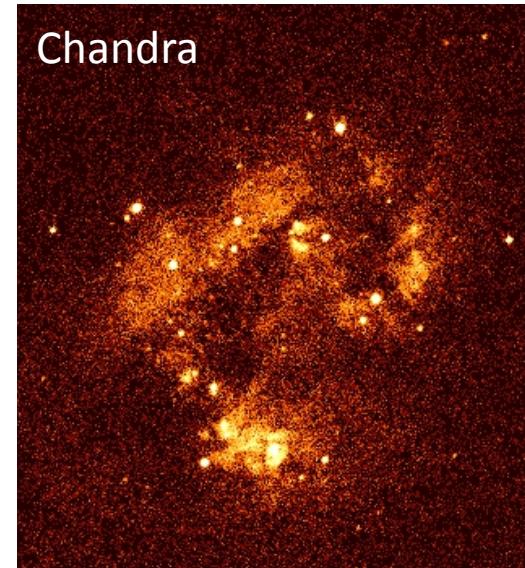
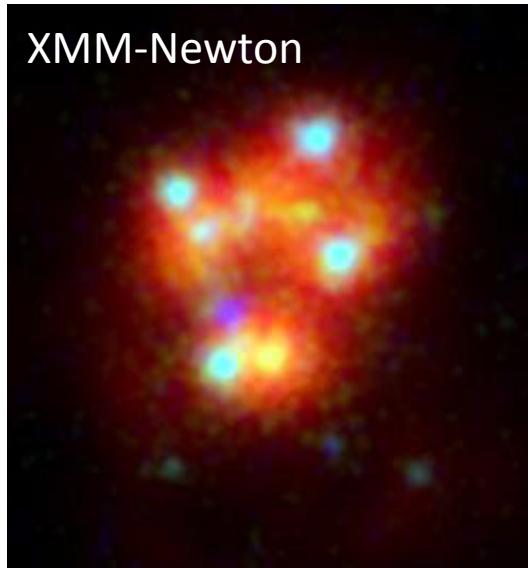
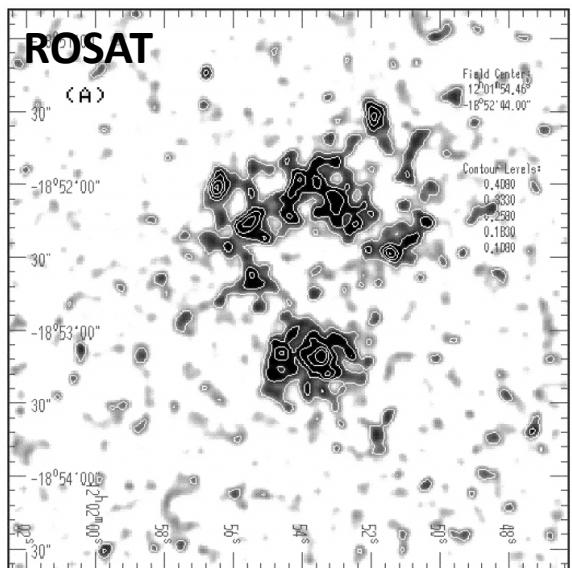
# Imaging analysis

Wide range of quality (resolution, depth)

Observations = Real image \* instrument response  
(Point Spread Function)

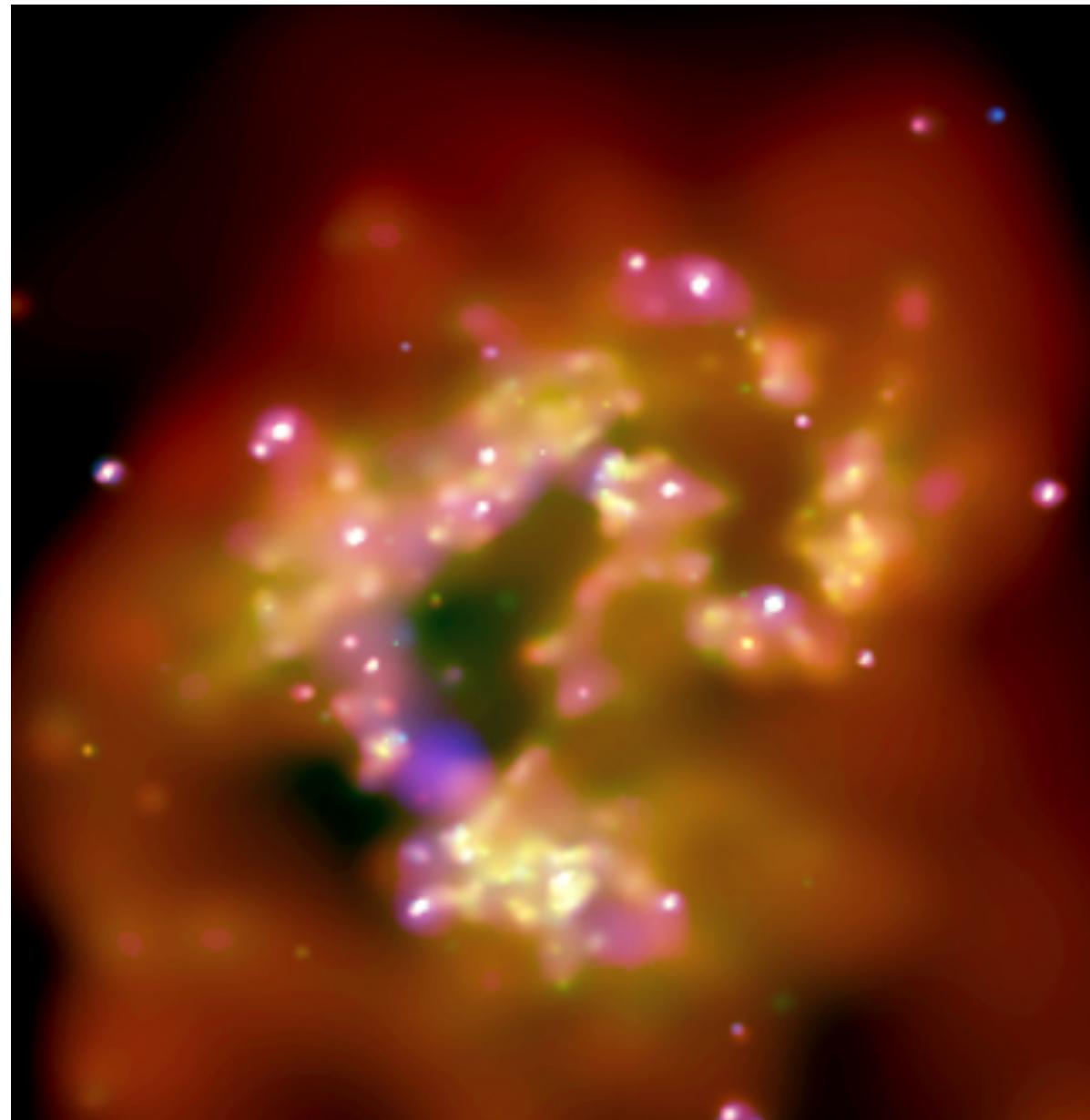
Multi-wavelength data

# Imaging analysis



# Imaging analysis

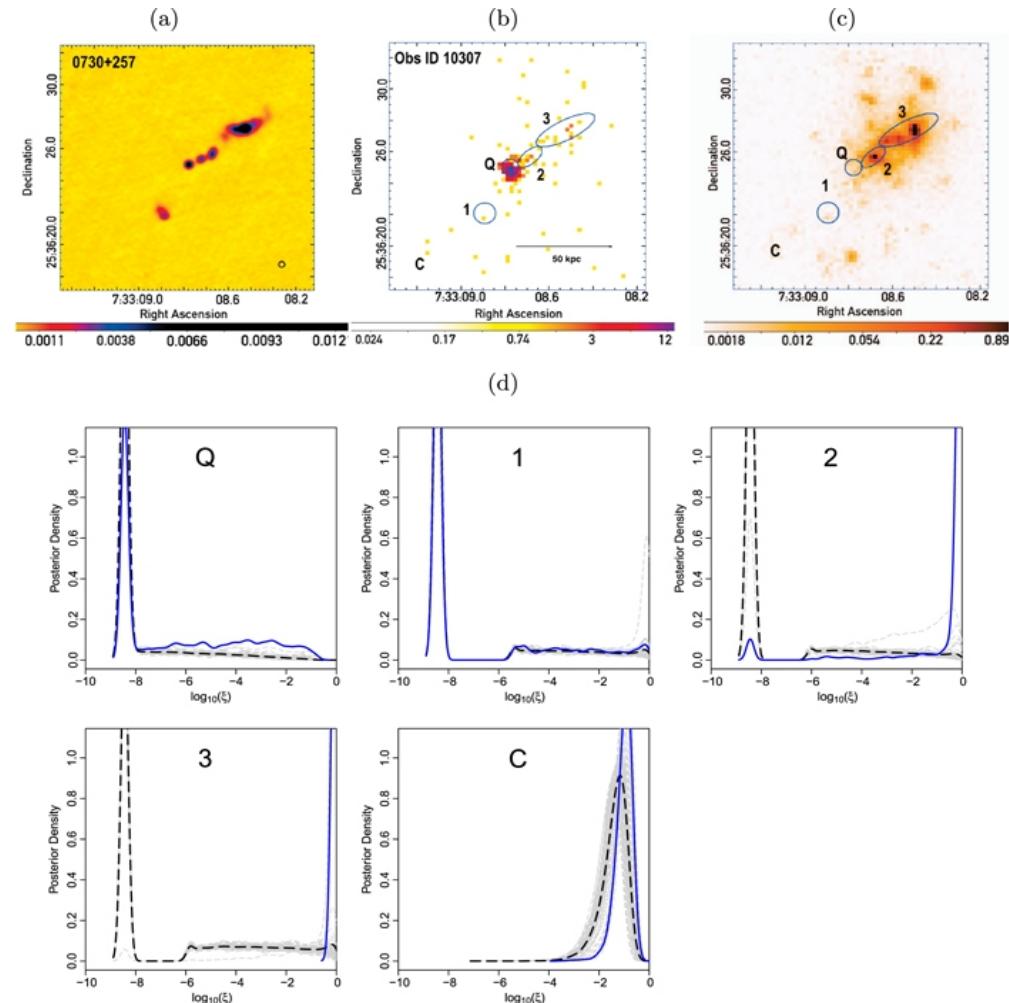
Multi-**sCale** data



# Imaging analysis

But we always want to squeeze out the most

- Detect structures

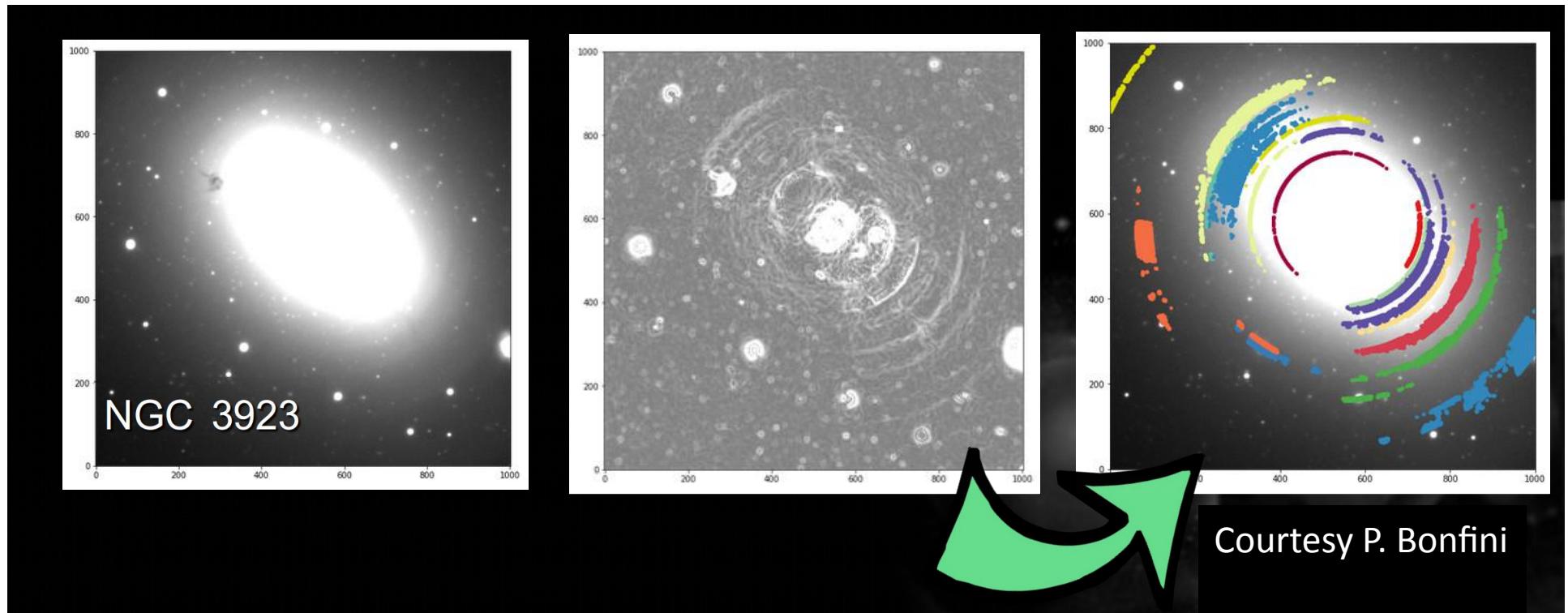


McKeough et al. 2016

# Imaging analysis

But we always want to squeeze out the most

- Bring out structures



# Imaging analysis

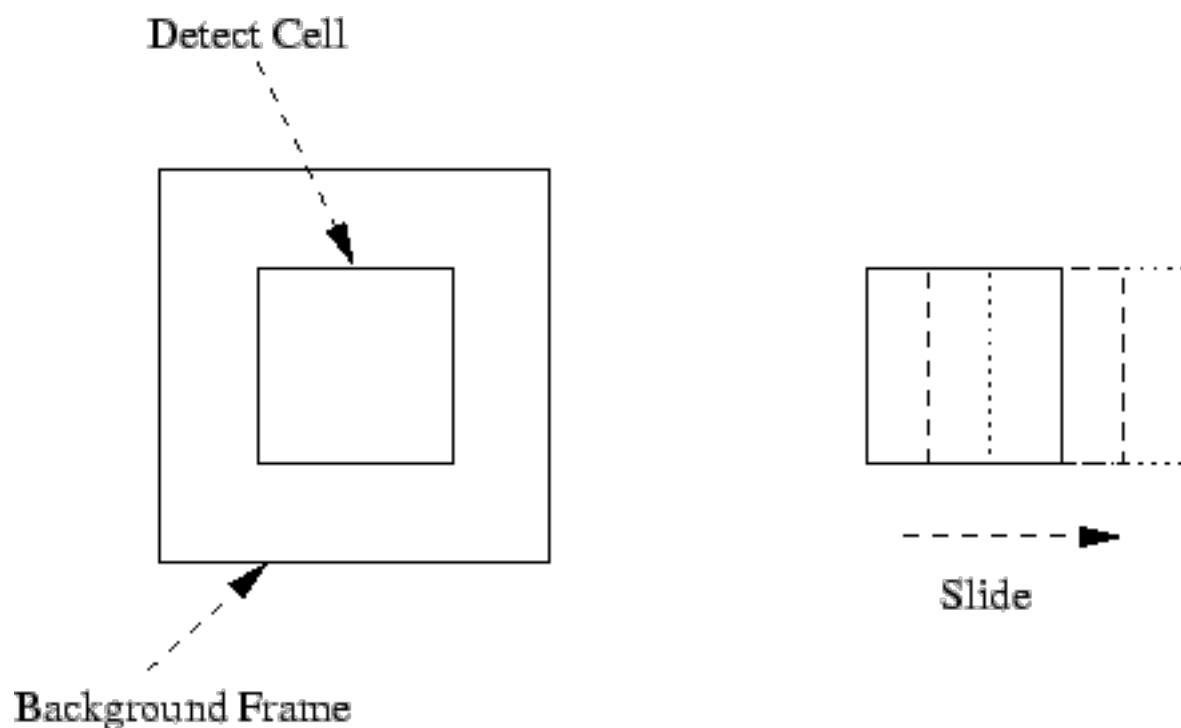
But we always want to squeeze out the most

- Detect structures
- Bring out structures
- Find the faintest sources
- Resolve sources

# Project I

## Next generation of source detection

Celldetect (+Max. likelihood)



Calderwood et al. 2001

# Project I

## Next generation of source detection

Celldetect (+Max. likelihood)

Wavelets

Convolve image with wavelet

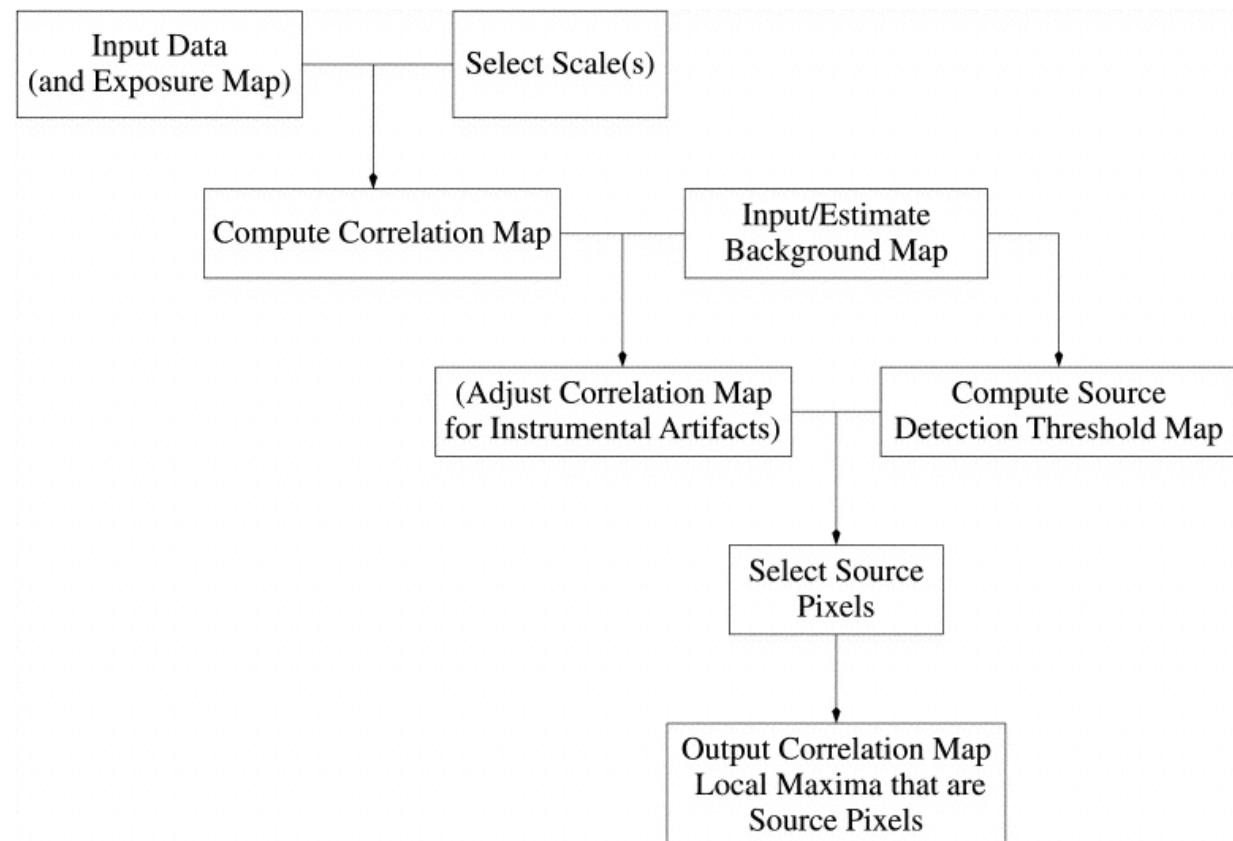
Identify maxima → create source list

# Project I

## Next generation of source detection

Celldetect (+Max. likelihood)

Wavelets



Freeman et al. 2001

# Next generation of source detection

Limitations of wavdetect

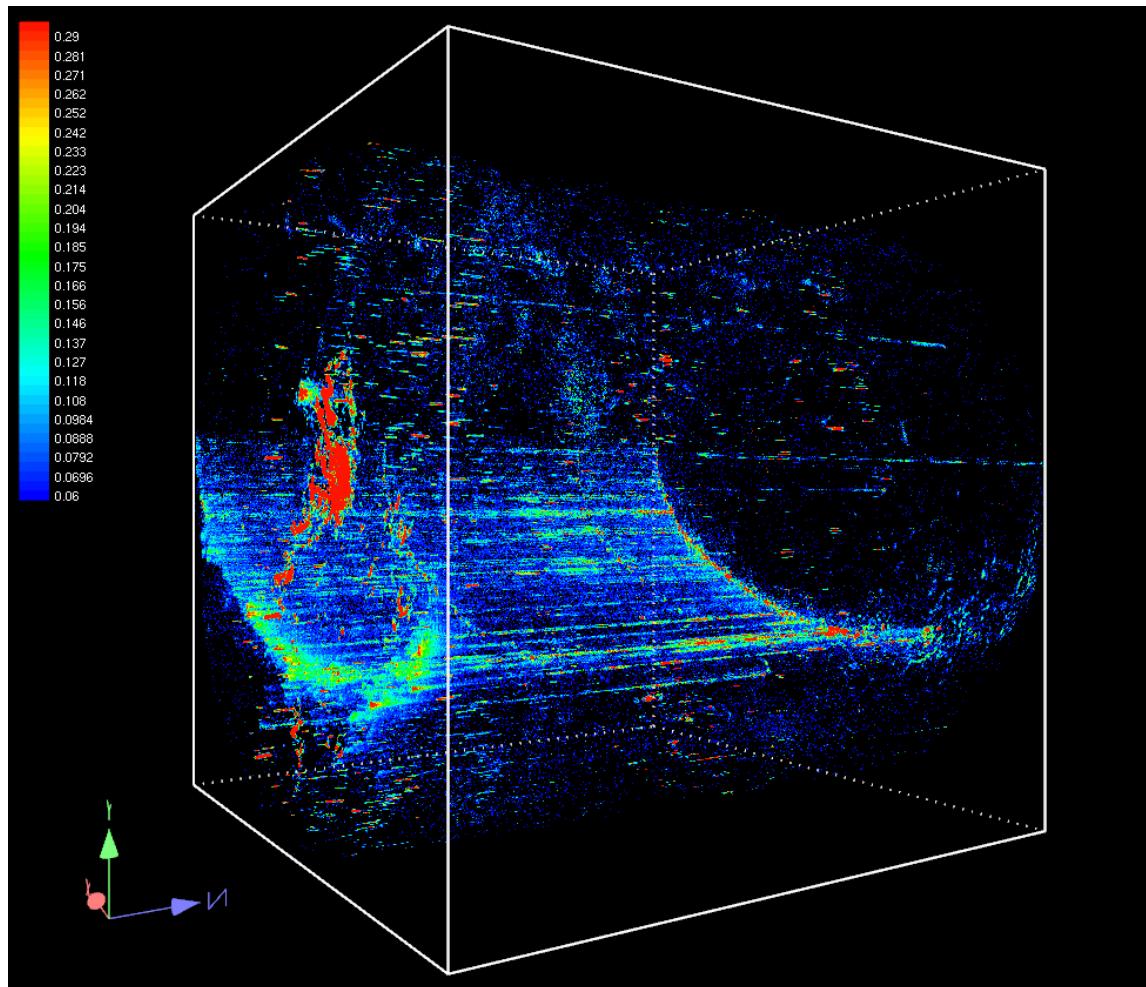
detection significance

detection efficiency

application on multiple datasets

# Next generation of source detection

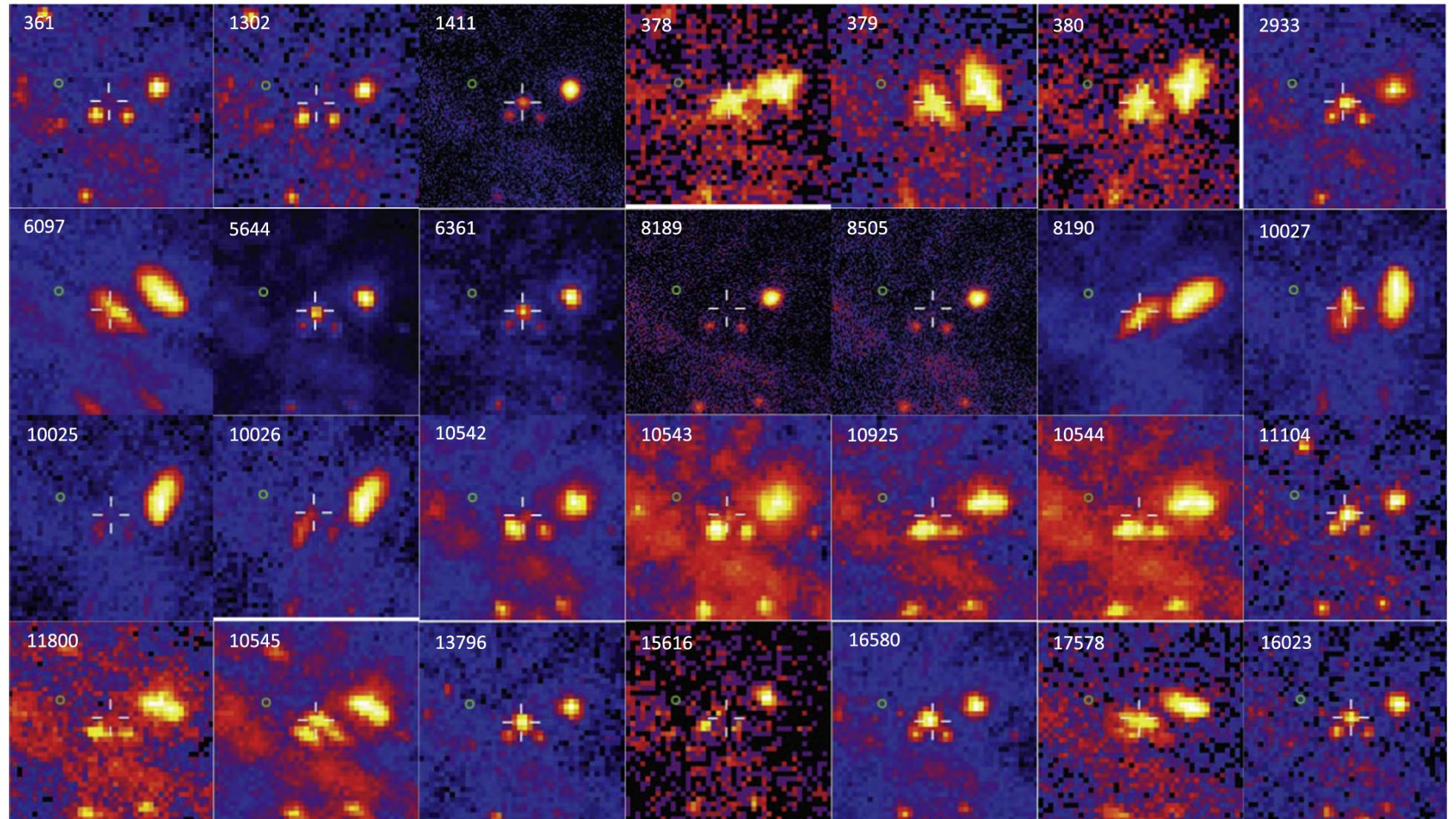
Multi-dimensional – multi-scale detection



<https://www.atnf.csiro.au/research/WALLABY/3Dvis.html>

# Project II

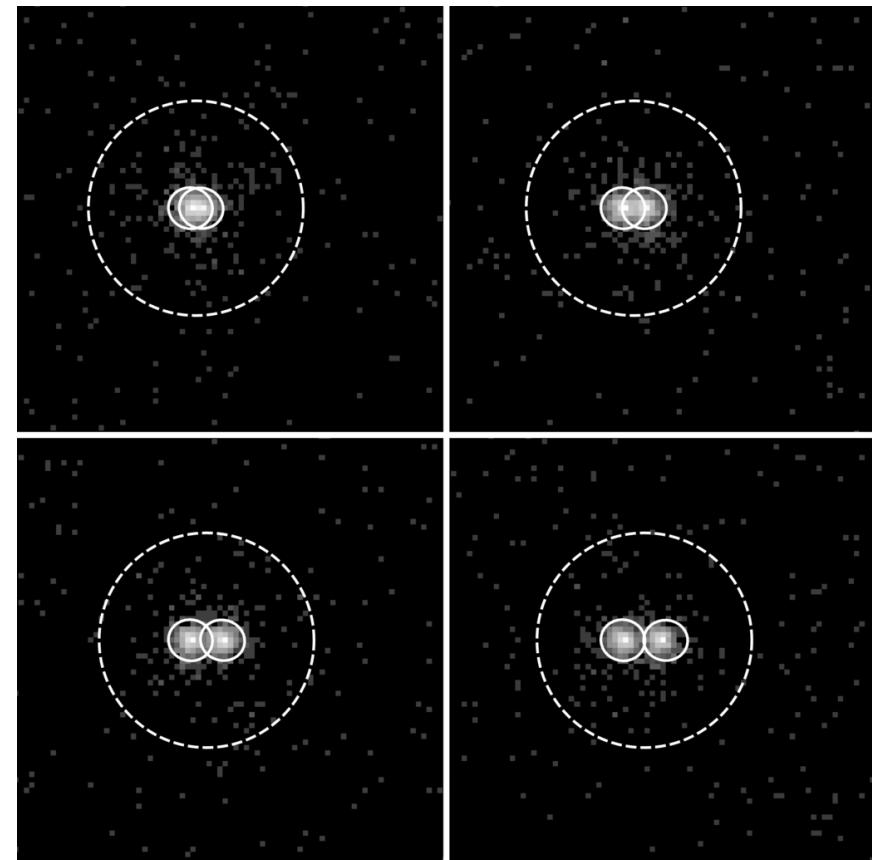
## Source confusion



Brightman et al. 2016

# Source confusion

2D joint fit of two sources

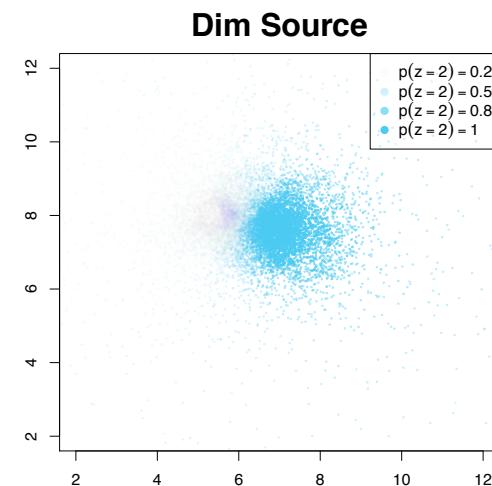
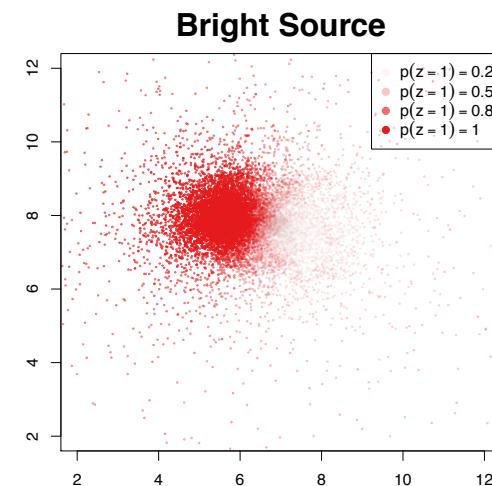
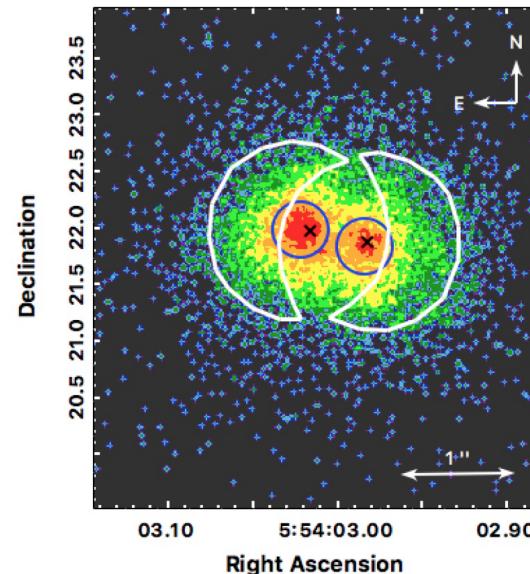


Primini & Kashyap 2014

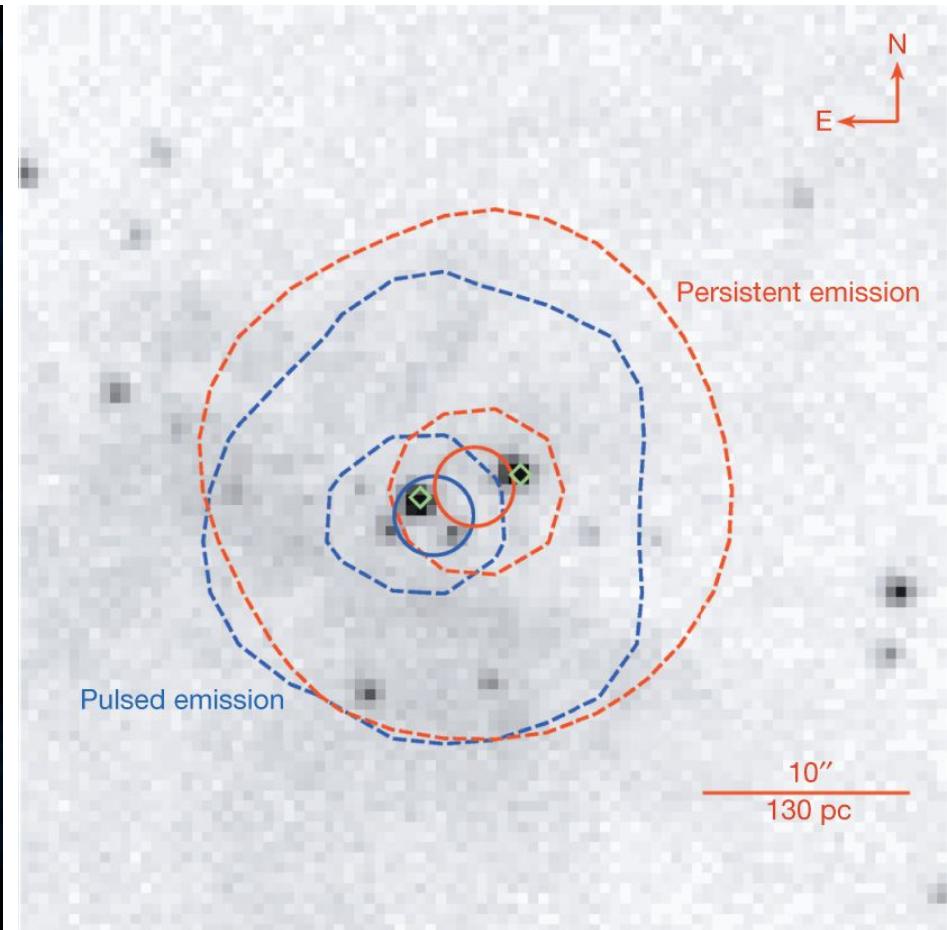
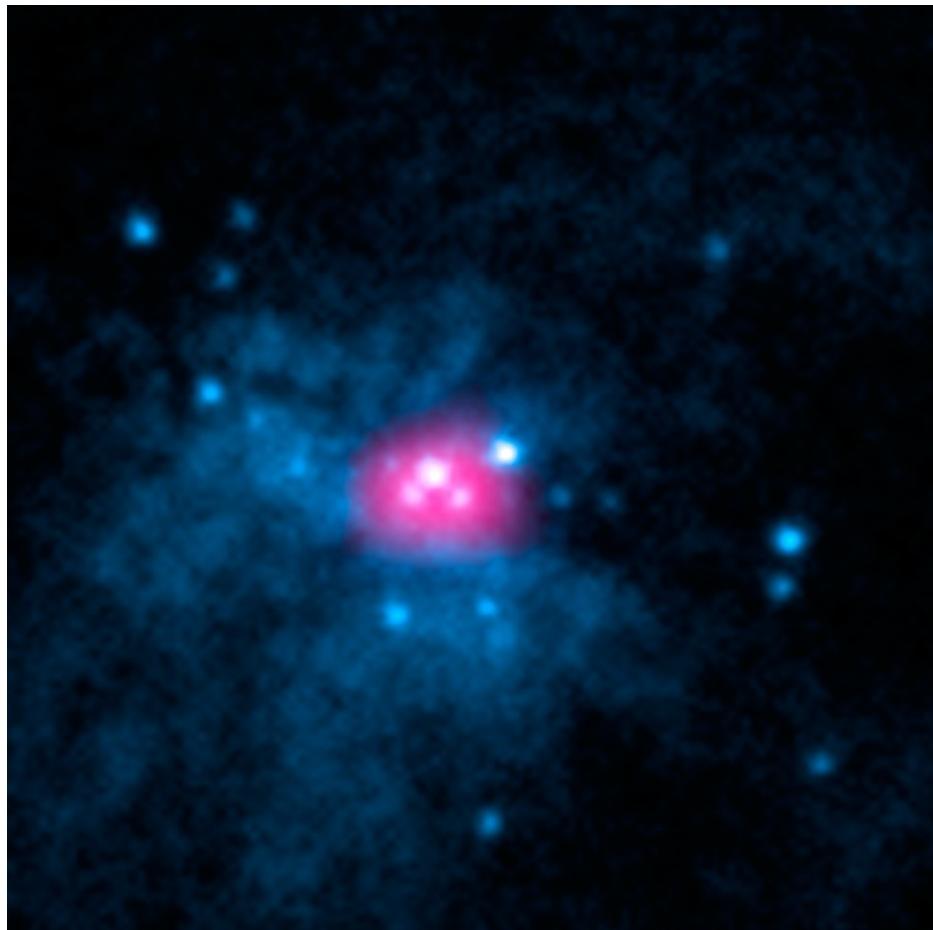
# Source confusion

2D joint fit of two sources

3D spectro-spatial (David Jones)  
tempo-spatial (Luis Campos)



# Source confusion



Bachetti et al 2014

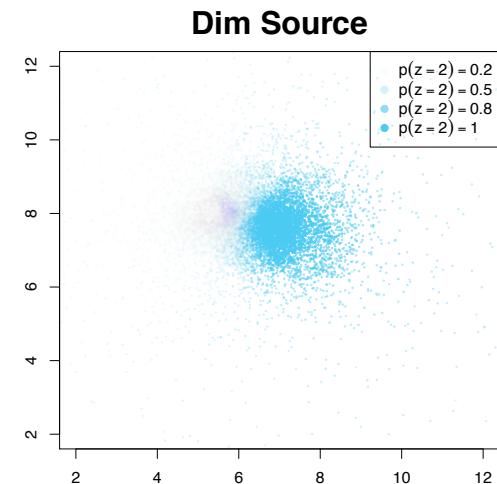
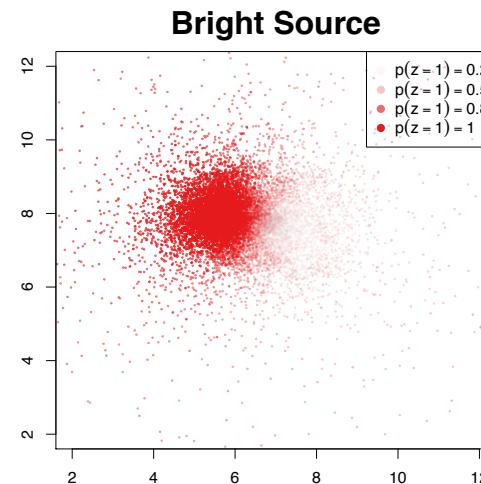
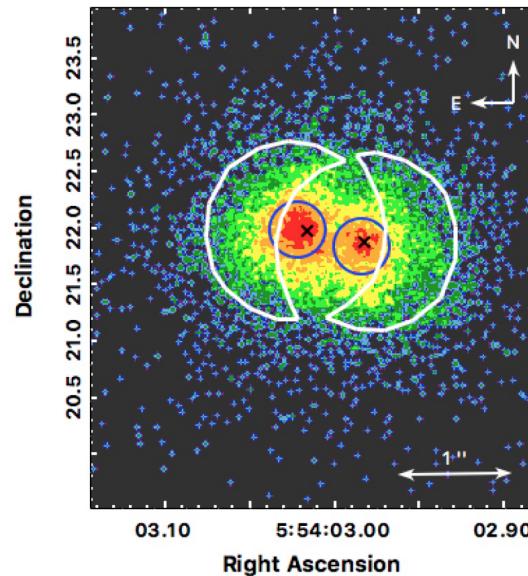
# Source confusion

2D joint fit of two sources

3D spectro-spatial (David Jones)  
tempo-spatial (Luis Campos)

Next step:

4D spectro-tempo-spatial (???)



# Looking ahead

X-ray telescopes

eROSITA, XRISM, ATHENA, Lynx, FORCE/HEXP

Optical surveys: LSST

Will require advanced source detection and  
source characterization methods